

HTM Explorer

R-based software for inspection and analysis of image-derived data

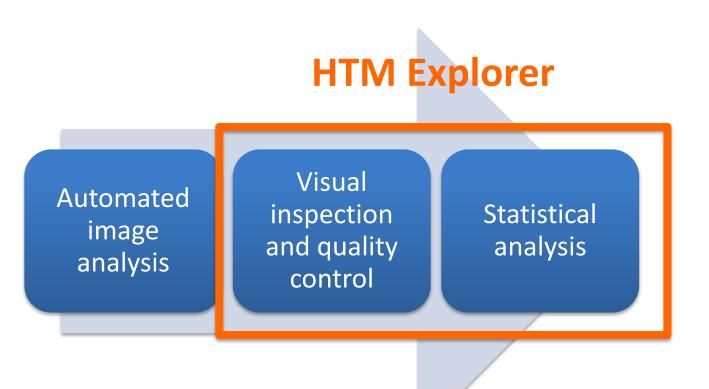


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Motivation



Automated image analysis typically results in big results tables that require quality control and statistical analysis.

Typical steps are:

- Identify images where image analysis failed (=> improve image analysis)
- Check data for spatial effects, e.g., cell seeding... (=> improve experimental conditions)
- Perform image-based quality control (e.g., focus quality and cell density)
- Our R-based HTM Explorer software facilitates this workflow by:
- Ease of use to perform standard taks via a GUI

• Compute statistical signficance of treatment effects

- Plotting: interactive (Zoom and Click&View) and annotated (QC, treatment, ...)
- Click&View functionality displays the images associated with each data point in ImageJ • Freedom to perform non-standard analysis via the R-console

Shortcomings of some otherwise very good existing solutions (as of 2 years ago):

cellHTS2: R-package for console-based HTM data analysis

- Requires coding (no GUI)
- No plotting with link back to the images
- Finished project => small adaptations hardly possible (e.g., current version required same number of replicates for each layout ...)

CellProfiler Analyst: Python-based GUI for HTM data analysis

- No access to data without GUI (=> not flexible)
- No statistical analysis • Limited image raw data interaction

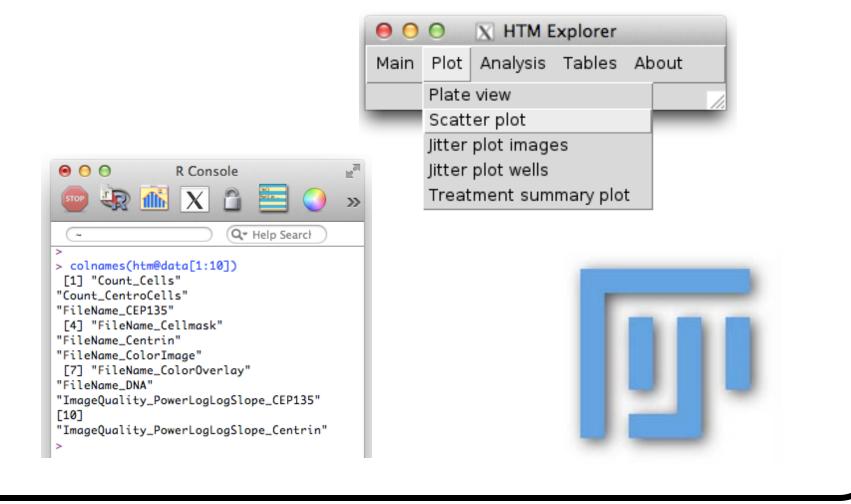
SpotFire:

- Commerical => difficult to distribute
- Limited image raw data interaction
- Statistical tools?
- Scripting access to data?

Design: R, R-GUI, and ImageJ

Access to data and HTM Explorer functions from both GUI and R console => convenient use and flexibility

- Image display with ImageJ: => access to pixel values
- => measurement tools
- => support for all image formats (bioformats)



Data Loading and Configuration

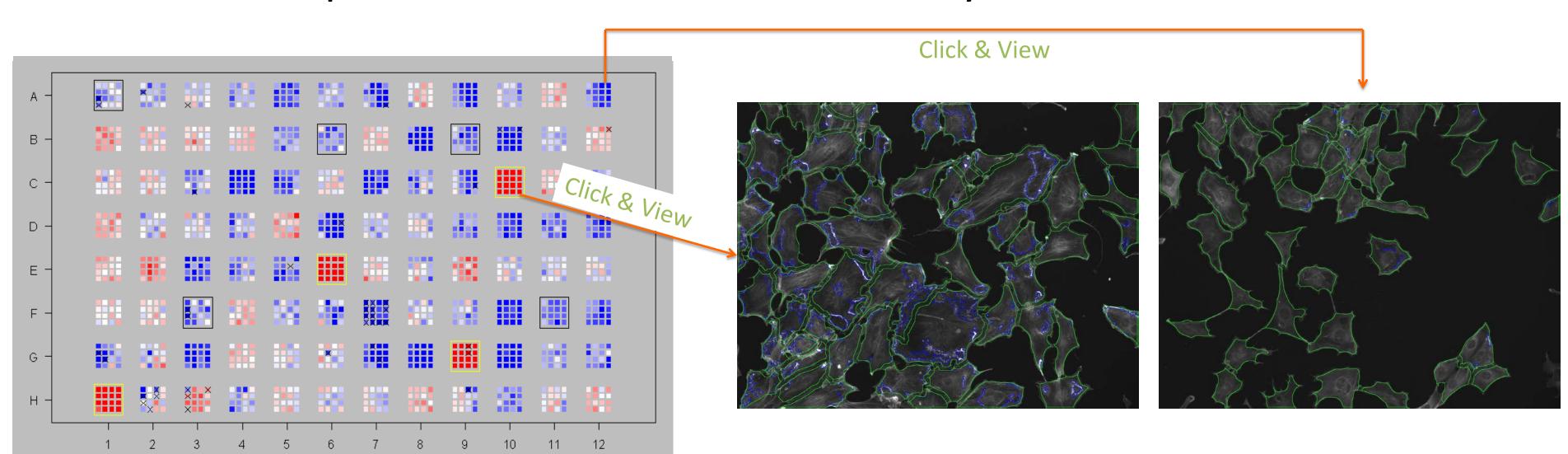
Input: one table where each row contains data for one image (incl. paths to raw data)

	A	В	C		D		E			F	G	
1	Metadata_treatment	Count_Cells	FileName_DNA	File	leName_GFF	File	Name_RFF	P	FileName_Ti	ledimage	ImageQuality_PowerLogLo	Intensity
2	s26312SNX24	5	Pilot_screen_autophagy_0	1s26312 Pil	lot_screen_a	auto Pilo	t_screen_a	autop	Pilot_screen	_autophagy_01	-2.105476036	
3	emptyempty	63	Pilot_screen_autophagy_0	1empty-Pil	lot_screen_a	auto Pilo	t_screen_a	autop	Pilot_screen	_autophagy_01	-2.091430255	
4	s26312SNX24	70	Pilot_screen_autophagy_0	1s26312 Pil	lot_screen_a	auto Pilo	t_screen_a	autop	Pilot_screen	_autophagy_01	-2.014917843	
5	emptyempty	43	Pilot_screen_autophagy_0	1empty-Pil	lot_screen_a	auto Pilo	t_screen_a	autop	Pilot_screen	_autophagy_01	-2.198471848	
6	s26312SNX24	49	Pilot_screen_autophagy_0	1s26312 Pil	lot_screen_a	auto Pilo	t_screen_a	autop	Pilot_screen	_autophagy_01	-2.155689998	
7	s26312SNX24	41	Pilot_screen_autophagy_0	1s26312 Pil	lot_screen_a	auto Pilo	t_screen_a	autop	Pilot_screen	_autophagy_01	-2.036124049	
8	s26312SNX24	43	Pilot_screen_autophagy_0	1s26312 Pil	lot_screen_a	auto Pilo	t_screen_	autop	Pilot_screen	_autophagy_01	-2.084427063	
9	emptyempty	46	Pilot_screen_autophagy_0	1empty-Pil	lot_screen_a	auto Pilo	t_screen_	autop	Pilot_screen	_autophagy_01	-2.089974801	
10	s26312SNX24	49	Pilot_screen_autophagy_0	1s26312 Pil	lot_screen_a	auto Pilo	t_screen_	autop	Pilot_screen	_autophagy_01	-2.046445642	
11	s26312SNX24	50	Pilot_screen_autophagy_0	1s26312 Pil	lot_screen_a	auto Pilo	t_screen_a	autop	Pilot_screen	_autophagy_01	-1.898488469	
12	s26312SNX24	13	Pilot_screen_autophagy_0	1s26312 Pil	lot_screen_a	auto Pilo	t_screen_a	autop	Pilot_screen	_autophagy_01	2.1379846	
13	emptyempty	83	Pilot_screen_autophagy_0	1empty-Pil	lot_screen_a	auto Pilo	t_screen_a	autop	Pilot_screen	_autophagy_01	-1.948964633	
14	s26312SNX24	37	Pilot_screen_autophagy_0	1s26312 Pil	lot_screen_a	auto Pilo	t_screen_	autop	Pilot_screen	_autophagy_01	-2.203969846	
15	emptyempty	69	Pilot_screen_autophagy_0	1empty-Pil	lot_screen_a	auto Pilo	t_screen_a	autop	Pilot_screen	_autophagy_01	-2.023492528	
16	s603MTOR	32	Pilot_screen_autophagy_0	1s603N Pil	lot_screen_a	auto Pilo	t_screen_a	autop	Pilot_screen	_autophagy_01	-2.249536489	
17	emptyempty	35	Pilot_screen_autophagy_0	1empty-Pil	lot_screen_a	auto Pilo	t_screen_a	autop	Pilot_screen	_autophagy_01	-2.099075184	
18	s603MTOR	39	Pilot_screen_autophagy_0	1s603N Pil	lot_screen_a	auto Pilo	t_screen_a	autop	Pilot_screen	_autophagy_01	-2.152309051	
19	emptyempty	0	Pilot_screen_autophagy_0	1empty-Pil	lot_screen_a	auto Pilo	t_screen_a	autop	Pilot_screen	_autophagy_01	-0.662304092	
20	s603MTOR	16	Pilot_screen_autophagy_0	1s603N Pil	lot_screen_a	auto Pilo	t_screen_	autop	Pilot_screen	_autophagy_01	-2.157829421	
21	emptyempty	75	Pilot_screen_autophagy_0	1empty-Pil	lot_screen_a	auto Pilo	t_screen_	autop	Pilot_screen	_autophagy_01	-2.044589396	
22	CEUS MATOR	11	Dilat serson autonhami O	1 -E03 N Dil	lat caroon a	outo Dilo	t coroon	auton.	Dilat caroon	sutanhami 01	2 127501240	
	000		X Sele	ect colum	ın names	cont	aining					
	Treatmer	nt:	Metadata_siRNA_gene								•	
	Experime	nt (==Plate):	Metadata_PlateName								▼	
	Well coor	dinate:	Metadata_WellNum							•		

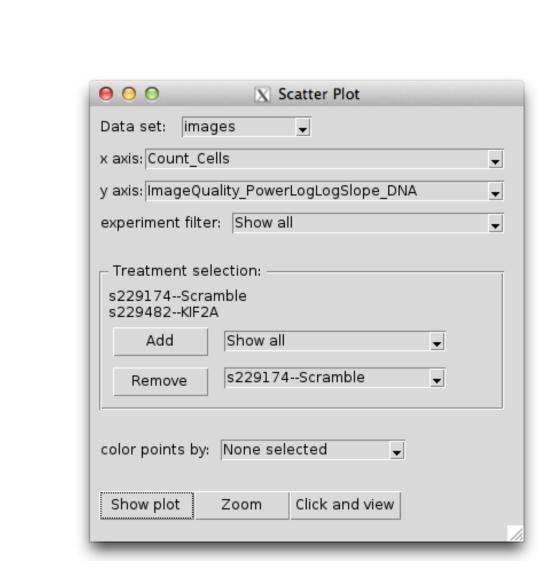
Metadata_PosNum

Interactive and Annotated Plotting

Visualize spatial effects and check efficiency of control treatments



Monitor out-of-focus images



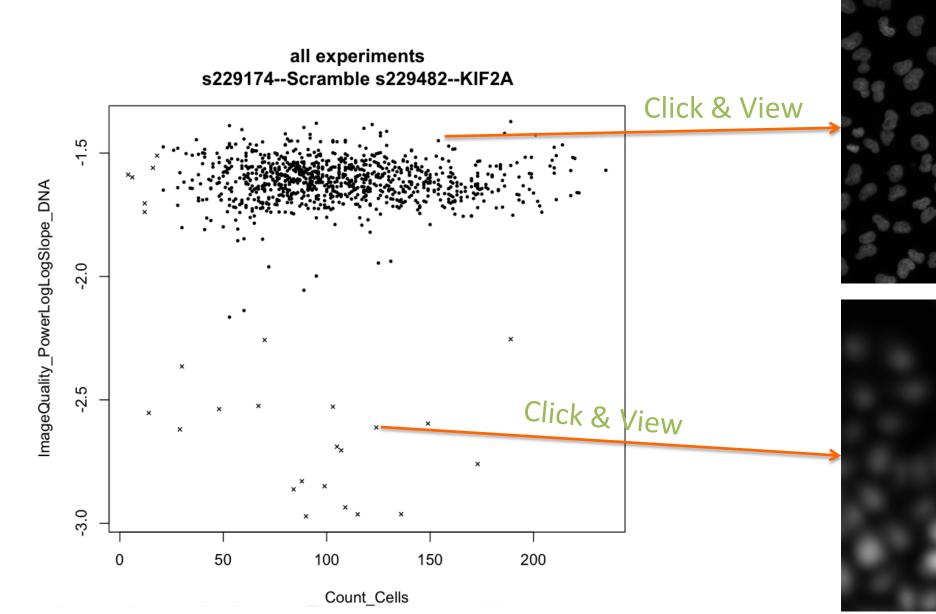
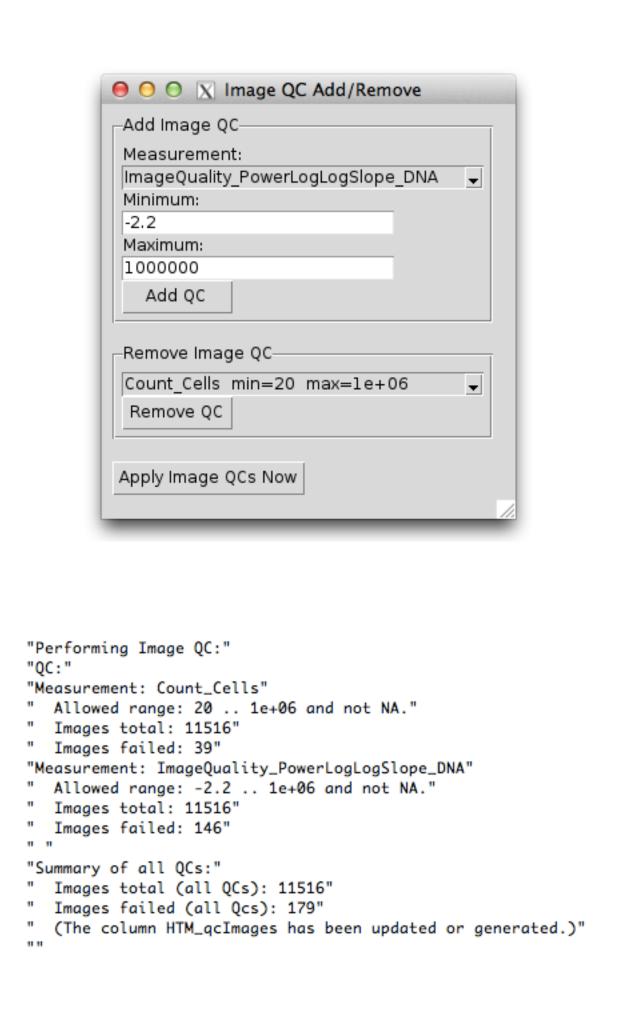


Image Filtering



Statistical Analysis

Median_z_score:

- Mean and SD based z-score against controls of same batch
- Median z-score of all batches

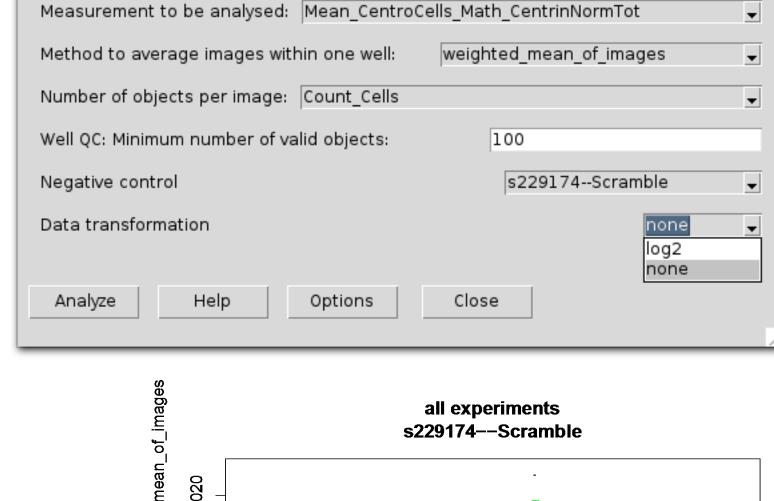
Median__robust_z_score:

- Median and MAD based z-score against controls of same batch
- Median z-score of all batches

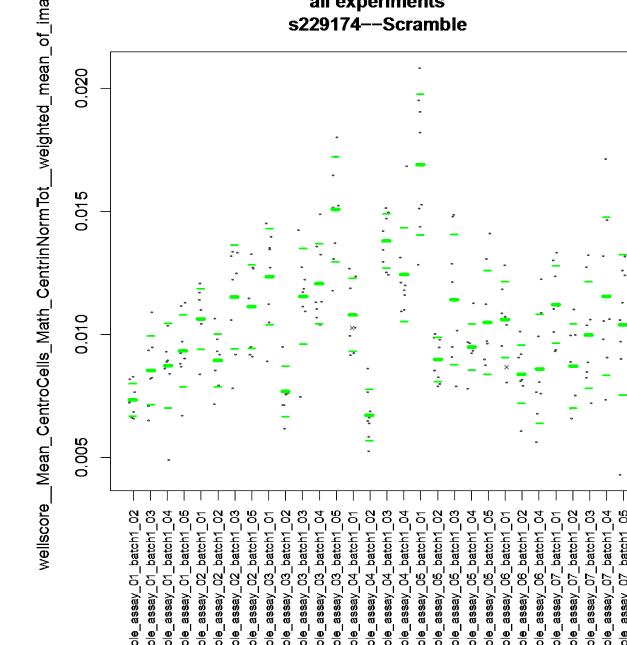
ANOVA:

- For each treatment: t-test against all controls ("reference") occuring in same batches as the treatment; with batch-effects as "blocking factor"
- Implementation using R-commands: lm() and summary()

	A	В	C	D	E	F	G	H		J	K	L
	controls	treatment	ANOVA_pValue	ANOVA_signCode	ANOVA_estimate	ANOVA_std_error	medianz_score	medianrobust_z_score	mean_objects_per_image	numObjectsOK	numlmagesOK	numReplicatesOK
	s229174Scramble	s46485SASS6	4.16E-27	***	-0.003078976	0.000262046	-2.292740451	-2.286999384	138.1452632	65619	475	30
l	s229174Scramble	s2928CETN2	2.19E-09	***	-0.00662184	0.000787323	-4.797163536	-4.591826244	187	2992	16	4
l	s229174Scramble	s22504ANKRD26	6.40E-07	***	0.006857659	0.001155702	5.117062637	4.247161353	120.65	2413	20	!
	s229174Scramble	s12862STIL	8.54E-07	***	-0.004974332	0.000851227	-3.344979469	-4.149738415	147.4736842	2802	19	!
	s229174Scramble	s12863STIL	2.94E-06	***	-0.005338992	0.000978535	-3.196678121	-2.593812635	154.25	3085	20	!
	s229174Scramble	s24916C2CD3	4.53E-06	***	-0.00445746	0.000804182	-3.332483094	-3.564334923	149.5333333	2243	15	4
	s229174Scramble	s229741KIAA1731	7.36E-06	***	0.005119119	0.000946586	3.443611981	2.933647233	134.8125	2157	16	4
	s229174Scramble	s24917C2CD3	1.23E-05	***	-0.004732914	0.000945691	-2.403570543	-2.287194921	166.8	3336	20	!
	229174Scramble	s4201DYNC1H1	1.26E-05	***	0.004365705	0.000836822	3.057487362	2.725029052	111.5625	1785	16	4
	s229174Scramble	s194946SSNA1	2.41E-05	***	-0.004074873	0.000821627	-2.634646163	-3.185361494	177.375	2838	16	4
5	229174Scramble	s18785CCP110	2.87E-05	***	0.003934146	0.000803047	3.226315733	3.636366282	144.8125	2317	16	4
S	229174Scramble	s195AURKA	3.17E-05	***	-0.003895744	0.000800849	-2.886126041	-3.201270138	154.1875	2467	16	4
5	229174Scramble	s25153TTLL3	3.72E-05	***	0.004138349	0.000860705	2.999668859	2.683836731	91.4375	1463	16	
	s229174Scramble	s49993KIF4B	4.85E-05	***	-0.003504978	0.000739467	-2.32334578	-2.57165468	154.5	2472	16	
	s229174Scramble	s30774GIMAP5	5.62E-05	***	0.004004345	0.000858677	2.205939356	2.086922473	131.25	2100	16	4
	s229174Scramble	s7839KIF5A	6.99E-05	***	0.00452106	0.001016119	2.810184611	3.008792761	111.7894737	2124	19	
	s229174Scramble	s223149CETN2	7.73E-05	***	-0.003337111	0.000733134	-2.520375339	-3.895771894	139.2666667	2089	15	4
	s229174Scramble	s51220KIF24	0.000118429	***	0.003687355	0.00083779	1.981427134	1.756136917	140.4666667	2107	15	4
	s229174Scramble	s21083PLK4	0.000183294	***	-0.003416061	0.000800883	-2.454991719	-2.453428469	147.4375	2359	16	4
I	s229174Scramble	s20671DCTN2	0.000223685	***	-0.003307488	0.00081315	-2.012451281	-2.430071617	159.7894737	3036	19	5
ĺ	s229174Scramble	s1984BICD1	0.000519219	***	0.004284421	0.001129566	1.98146819	2.091771811	96.73684211	1838	19	



X Statistical Analysis



Usage Experiences

- HTM Explorer has been used in four microscopy-based screening projects, consisting each of 10k-100k images.
- HTM Explorer is readily used by researchers without any programming experierence.
- HTM Explorer is independently used by visitors even after they left EMBL.
- The combination of the R-GUI, R-console interface and image display in ImageJ so far has met all requirements.

Acknowledgements

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